

Precision Medicine and machine learning in Deep Brain Stimulation surgery for Parkinson's Disease: Ensuring individualized approach to improve efficacy

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Introduction and Motivation

Introduction

- Parkinson's Disease (PD):** A neurodegenerative disorder with variable symptoms and treatment responses.
- Deep Brain Stimulation (DBS):** A standard therapy that modulates neural circuits to improve function.

Role of AI in addressing PD using DBS:

- Machine learning enhances DBS by optimizing treatment planning and execution, offering a transformative approach

Motivation

AI enhances DBS by optimizing planning, personalizing treatment, and improving outcomes, addressing variable responses and rising PD prevalence in MENA

Challenges

- Analyze the imaging to construct connectivity maps between the Subthalamic Nucleus (STN), Globus Pallidus internus (GPI), and cortical regions.
- Improve the microelectrode recording to place the electrodes more precisely during deep brain stimulation surgery.
- Improve the programming after surgery.

Novel Contributions:

- AI-Driven Outcome Prediction:** Identifying key clinical and radiological features linked to DBS success.
- Enhanced Lead Placement:** Machine learning models improve precision in electrode positioning.

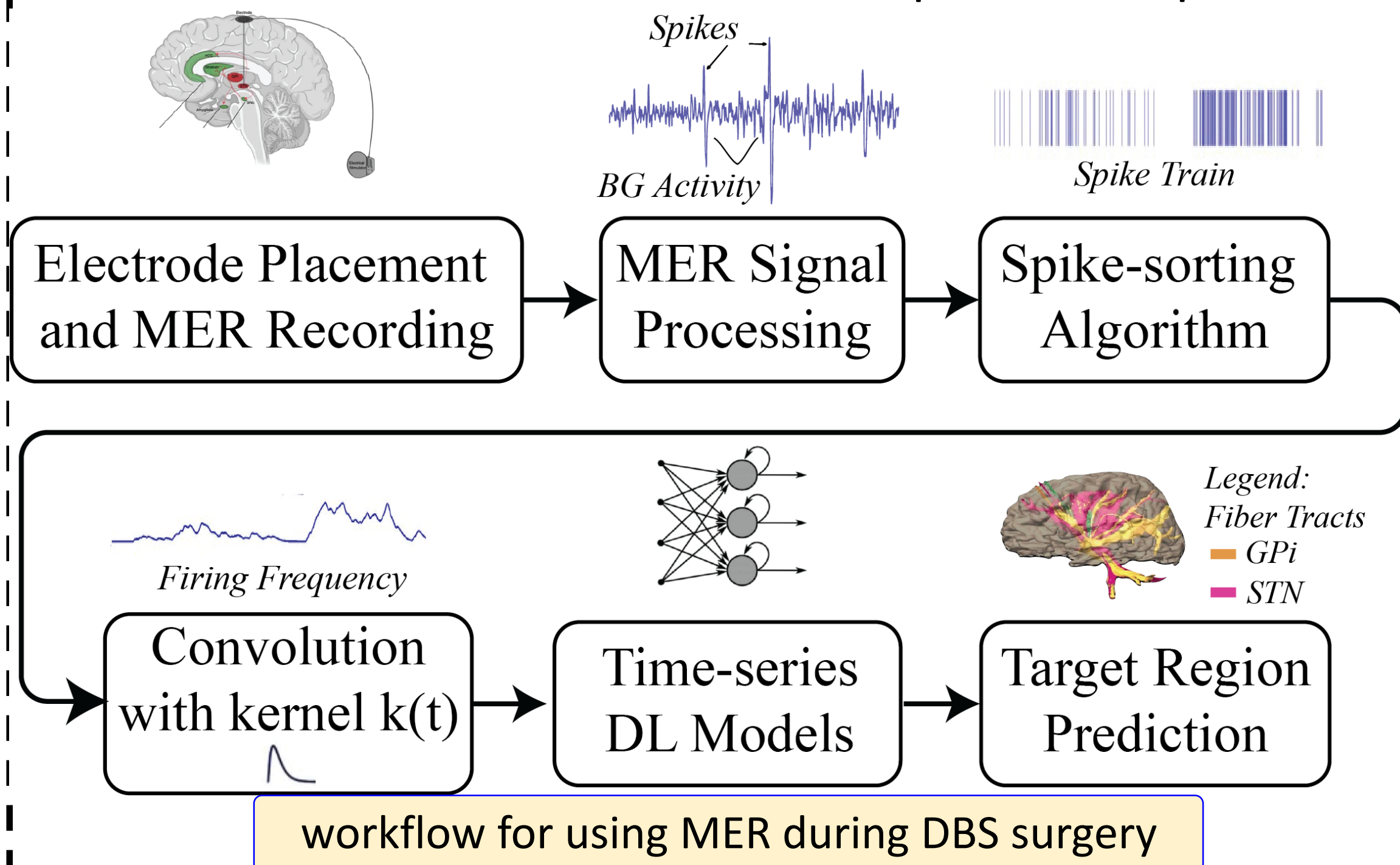
Functionalities

- Patient Selection & Imaging:** Identify DBS candidates and use MRI, DTI, and fMRI for brain mapping.
- Intraoperative Data Collection:** Record MER and LFP signals for neurophysiological mapping and spike-sorting.
- AI-Driven DBS Optimization:** Use ML to predict outcomes, refine lead placement, and adjust stimulation parameters dynamically.
- Postoperative Evaluation:** Cluster brain regions, augment data with PCA, VAEs, and GANs, and enhance interpretability with SHAP and LIME.
- Personalized DBS Programming:** Automate tuning to minimize clinic visits and use RL for safe, adaptive adjustments.

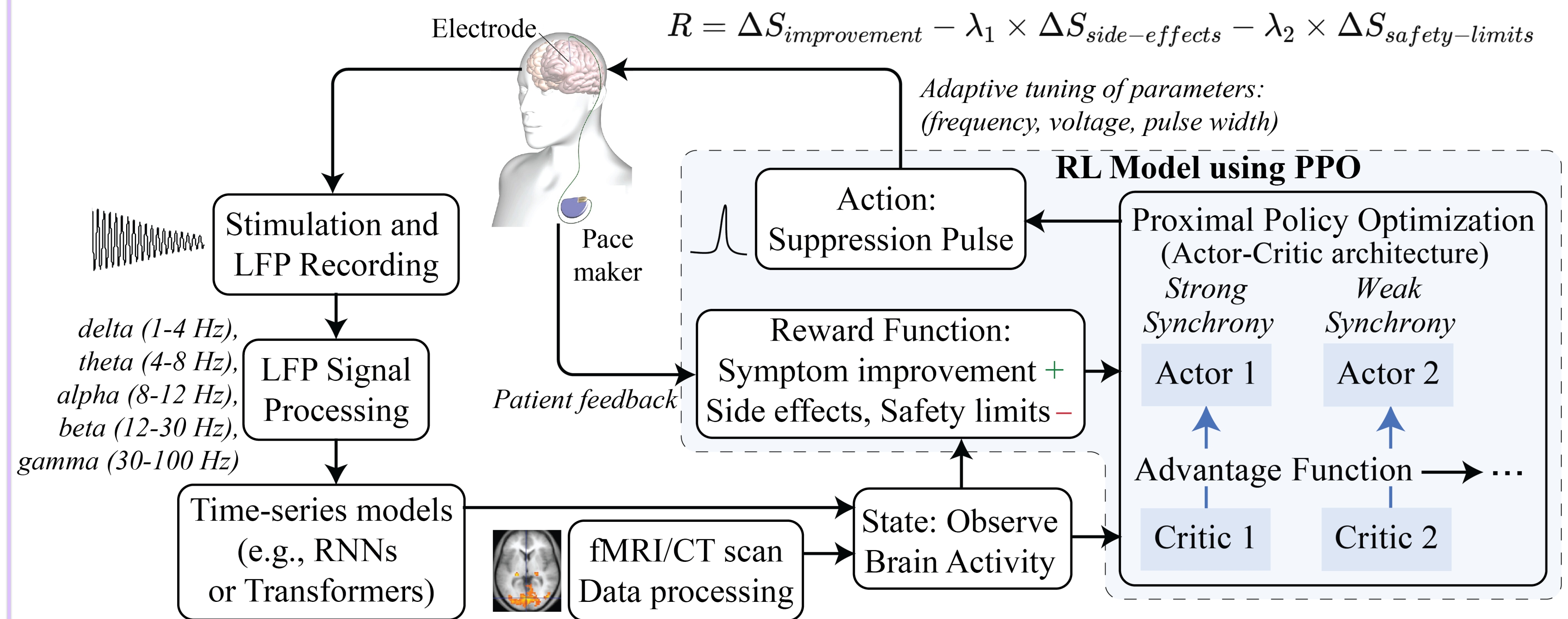
Proposed Methodology

Pre-operative Phase: DL models (CNNs, GNNs) will analyze MRI, DTI, and fMRI to map connectivity between STN, GPI, and cortical regions.

Intra-operative Phase: Spike-sorting algorithms classify MER signals, integrating convolved spikes with RNNs and LSTMs to enhance electrode placement precision.



Post-Operative Phase: Reinforcement Learning (RL) dynamically adjusts DBS parameters using LFP and fMRI data as state inputs, with PPO ensuring safe, gradual optimization:



Clustering algorithms will group brain regions by DBS response. PCA, VAEs, and GANs will augment data. SHAP and LIME will enhance interpretability, while diverse ML architectures will integrate multi-source data.

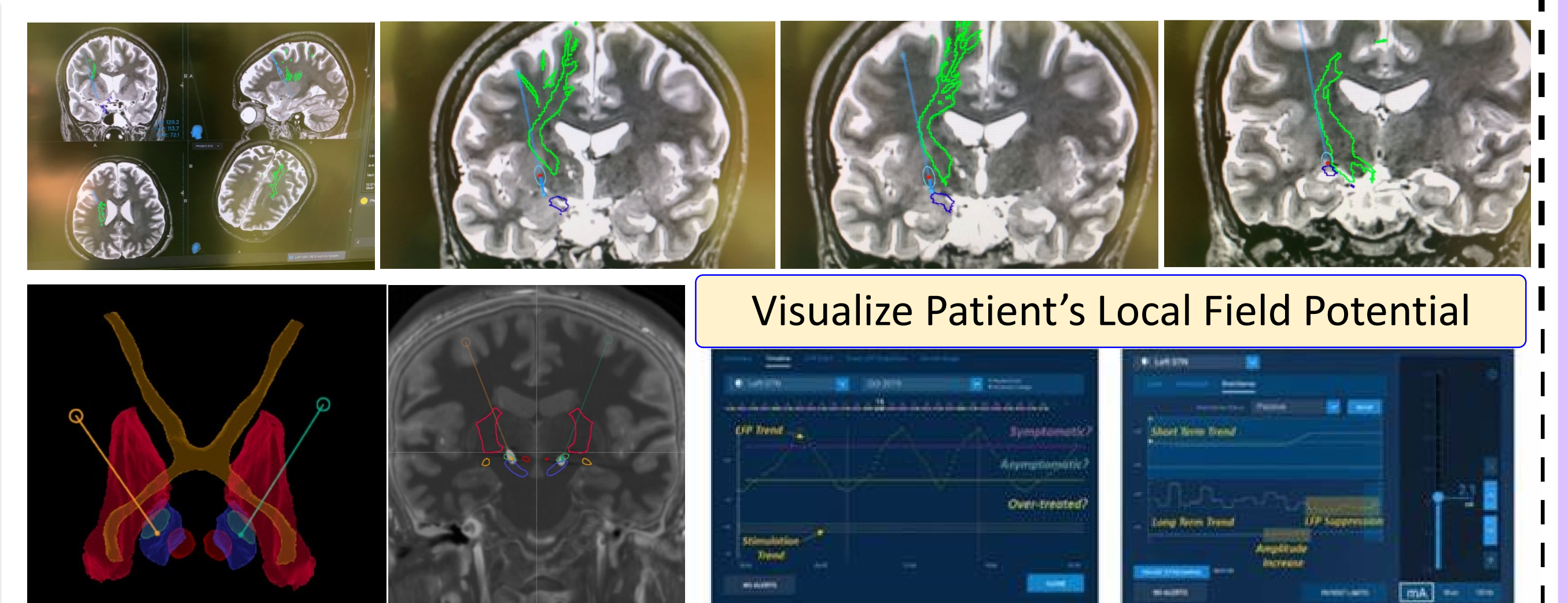
Feasibility and Proof of Concept Study

- 3D-Printed Brain Model:** A replica of patient's brain mounted in a skull stabilizer to simulate surgery.
- Stereotactic Needle Placement:** Imaging used to calculate and calibrate precise insertion.

- CT Scan Confirmation:** Post-insertion scanning verified needle position within a 1.2 mm margin.
- Precision Matters:** Even small errors in the brain can have significant consequences.

DBS Lead Placement:

- The DBS lead trajectory (blue) targets the STN (red), avoiding the motor (green) and visual (blue border) tracts to prevent complications.



Conclusion:

- The DBS clinical workflow is complex, involving multiple specialists and clinical challenges. We aim to leverage machine learning to enhance planning and execution, ensuring precise, personalized treatment for PD patients.

